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Patent Application for:

An N-squared Algorithm for Optimizing Correlated Events

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2 **An N-squared Algorithm for Optimizing Correlated Events**
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5 **TECHNICAL FIELD**
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7 This invention relates generally to the field of integrated circuit
8 systems, and more specifically to the detection of defects in digital integrated
9 circuits.
10

11 **BACKGROUND OF THE INVENTION**
12

13 An important aspect of the manufacture of integrated circuits (IC's) is the post-
14 production testing process. The goal of the post-production testing process is
15 to apply test inputs to a device and determine if the device is defective.
16 Preferably, this defect detection process occurs as early point as possible
17 since further integration of faulty components rapidly becomes very
18 expensive. Consider for example, attempting to determine the location of a
19 faulty IC in a personal computer system. There are several different kinds of
20 tests that can be applied to IC defect testing. Exhaustive tests seek to apply
21 every possible input in order to determine if any defects are present in the IC.
22 Functional testing tests the functions present on the IC for correct operation.
23 The fault model test determines each type of fault that is likely to occur, and
24 devises tests for these common faults. The exhaustive test can be the most
25 time-consuming and may also be expensive. Functional testing is problematic
26 in that the test design must accurately ensure that all functionality is correctly
27 tested. Functionality testing requires application specific knowledge to ensure

1 that all incorporated functionality has been tested. Fault modeling will detect
2 the faults assumed within the framework of the fault model. An example of
3 the fault model is the stuck-at fault model. This model assumes a limited
4 number of faults and assumes that the faults are permanent.

5
6 A well-designed test plan should use the least number of test inputs to cover
7 the most number of defects or defective dice (DD's),, and the test plan should
8 be designed so that a test sequence is executed in an efficient fashion. Many
9 of the exhaustive, functional, and fault models are based upon RTL and
10 schematics. Thus the influence of the physical layout of the IC and the
11 manufacture process (PLMP) on the defect creation in IC circuits is not
12 exploited in the test strategy. The lack of relation between the test input data
13 creation and the PLMP makes these methods susceptible to having
14 redundant tests and performing a test inefficiently. The number of redundant
15 tests and inefficient tests (RIT's) is a valuable parameter to consider when
16 designing test plans, since there is a strong benefit in terms of reducing test
17 execution time and test complexity when the number of RIT's are reduced.
18 Current strategies that reduce the number of RIT's seek to eliminate the
19 execution of redundant tests in the IC testing process using the same
20 exhaustive, functional, and fault model strategies used in IC standardized IC
21 testing.

22
23 Eliminating redundant tests and reordering tests to increase the test efficiency
24 has become an important area of research as the IC test becomes
25 increasingly expensive. In IC testing, tests are generated using simulations
26 and other means. Evaluating the tests is important for increasing test
27 efficiency and reducing test time. Efficient numerical algorithms for analyzing
28 the test redundancy and the test sequence efficiency are required to meet the
29 need for IC test time reduction techniques.

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3 Thus, there is an unmet need in the art for an efficient numerical algorithm for
4 analyzing a given test sequence redundancy and efficiency.

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SUMMARY OF THE INVENTION

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10 This invention discloses an N^2 algorithm for optimizing IC tests. The
11 test optimization of the present invention refers to minimizing the amount of
12 time spent on RIT's. The method of the present invention uses the IC
13 simulation data or IC production test data. The simulation data contains the
14 relation between tests and defects. The IC production data reflects the PLMP
15 and gives the relation between tests and DD's. Both of the data can then be
16 processed to detect RIT's in IC tests. The test optimization can occur on the
17 defect (fault) level using IC simulation data and the DD level using IC
18 production data. The optimization process is the same for both defects
19 (faults) and DD's, so only one approach will be described here.

20

21 The test optimization problem may be described as follows: Given N tests in
22 a test sequence and L DD's, each of the N tests detects between 1 and L of
23 the L DD's. And each test takes a certain amount of time to be executed.
24 The first part of the test optimization problem determines the set of tests
25 which takes the minimum number of tests to detect all the L DD's. The
26 second part of the test optimization problem determines the set of tests and
27 the execution sequence of the tests that takes the minimum time to detect all
28 the DD's.

29

1 Both test optimization problems can be framed in terms of representing N
 2 tests as N vectors. Each of the N vectors has L components, corresponding
 3 to the L DD's. For each of the N tests, we create a correlation vector, V. For
 4 test i, we have

$$5 \quad V(i) = (v_1(i), v_2(i), \dots, v_L(i)),$$

6 where $v_j(i)$ is equal to zero if test i does not detect DD j and is equal to one if
 7 test i detects DD j. After representing each test as a correlation vector, each
 8 test can be treated as an event in a correlated event problem. The execution
 9 time of a test can be treated as the time taken by the corresponding event.
 10 The list of DD's that a test detects is the correlation vector for the test.
 11 Therefore, the test optimization problem is the same as the minimum set
 12 optimization and the minimum time optimization problems of correlated
 13 events.

14
 15 Both parts of the test optimization problem can take on the order of N!
 16 operations to determine the optimum set. A vector projection technique is
 17 used to calculate the correlation between the N correlation vectors. This
 18 projection technique requires on the order of N^2 operations to optimize the
 19 correlated event problem.

20 The following algorithm takes on the order of N^2 operations to determine the
 21 minimum set in which each test is represented as a correlation vector:

- 22 a. Choose a correlation vector in the N vectors such that the correlation
 23 vector contains the most number of non-zero components. Assign this
 24 vector to vector W. Store this vector.
- 25 b. Determine a correlation vector of the remaining correlation vectors such
 26 that the length of the projection of the multiplication of W and the
 27 complement of the vector onto the unit vector is the smallest.
- 28 c. Store this vector, and update W to be the multiplication of W and the
 29 complement of this vector. Repeat the previous step b until the projection

- 1 of W onto the unit vector becomes zero.
- 2
- 3 The following algorithm takes on the order of N^2 operations to determine the
- 4 minimum time:
- 5
- 6 Represent each test as a correlation vector.
- 7 a. Choose a correlation vector in the N vectors such that the vector has the
- 8 largest value of the number of non-zero components divided by the time
- 9 associated with the vector. Multiply the complement of this vector with the
- 10 unit vector and form a vector W. Store this vector.
- 11 b. Determine a correlation vector of the remaining correlation vectors such
- 12 that the length of the projection of the vector onto vector W divided by the
- 13 time associated with the vector is the largest.
- 14 c. Store this vector, and update W to be the multiplication of W and the
- 15 complement of this vector. Repeat the previous step b until the projection
- 16 of vector W onto the unit vector becomes zero.

17 18 19 BRIEF DESCRIPTION OF THE DRAWINGS

20
21 The features of the invention believed to be novel are set forth with
22 particularity in the appended claims. The invention itself however, both as to
23 organization and method of operation, together with objects and advantages
24 thereof, may be best understood by reference to the following detailed
25 description of the invention, which describes certain exemplary embodiments
26 of the invention, taken in conjunction with the accompanying drawings in
27 which:

28
29

1 **FIG. 1** is a block diagram of a minimum set optimization method,
2 according to an embodiment of the present invention.

3
4 **FIG. 2** is a block diagram of a minimum time optimization method,
5 according to an embodiment of the present invention.

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8

DETAILED DESCRIPTION OF THE INVENTION

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10 While this invention is susceptible of embodiment in many different forms,
11 there is shown in the drawings and will herein be described in detail specific
12 embodiments, with the understanding that the present disclosure is to be
13 considered as an example of the principles of the invention and not intended
14 to limit the invention to the specific embodiments shown and described. In the
15 description below, like reference numerals are used to describe the same,
16 similar or corresponding parts in the several views of the drawings.

17

18 The disclosed algorithm for optimizing correlated events is applied to the
19 problem of analyzing redundant tests and reordering tests. Thus, as will be
20 shown below, the problem of analyzing redundant tests and reordering tests is
21 equivalent to analyzing correlated events. The description of this invention
22 contains three parts: The formulation for correlated events, the algorithm for
23 optimizing the correlated event problem, and the mapping between the
24 correlated event optimization problem and the related test optimization
25 problem.

26

Correlated Events

27
28 Consider N events that may occur in any sequence. Number the N events
29 using integers from 1 to N. If the N events are correlated, the occurrence of

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1 some of the events depends on the occurrence of other events. For example,
2 consider $N = 5$. The correlation among the five events may be the following:

- 3
- 4 1) If events 2, 4 and 5 take place before events 1 and 3, then events 1 and 3
5 will not occur.
- 6 2) If events 1 and 5 take place before events 2, 3 and 5, then events 2, 3,
7 and 5 will not occur.

8 Conditions 1) and 2) define the correlation among the five events in this
9 example.

10

11 In the N correlated events, there is at least one such set of events that their
12 occurrence prevents other events from occurring. In general, there exists
13 more than one such set of events. Such a set of events is called a minimum
14 set. The problem of finding the minimum set of events is referred to as a
15 minimum set optimization problem. In the above example, events 1 and 5,
16 are the minimum set. Finding the minimum set of a collection of events is
17 difficult in general because the correlation among events is defined implicitly
18 and the value of N is often large. Therefore, the complexity of the
19 computation for finding a minimum set is very high.

20

21 To formulate the correlation among N events, we represent each of the N
22 events as a binary vector in an L -dimensional correlation space. Each of the
23 components of a binary vector is $(0,1)$ valued. The binary vectors are called
24 correlation vectors. Let $V(i)$ be the correlation vector associated with event i .

25 Then,

26
$$V(i) = (v_1(i), v_2(i), \dots, v_L(i))$$

27 where $v_j(i)$ is the j th component of correlation vector $V(i)$ and is $(0,1)$ -valued.

28 To describe the correlation among the N events, we need to define the
29 operations of the multiplication, addition, and complement of correlation

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1 vectors. Define multiplication of correlation vectors $V(i)$ and $V(j)$ to be
2 $V(i)V(j) = (v_1(i) \& v_1(j), v_2(i) \& v_2(j), \dots, v_L(i) \& v_L(j))$,
3 where $\&$ is the Boolean AND operator. Define the addition of correlation
4 vectors $V(i)$ and $V(j)$ to be
5 $V(i)+V(j) = (v_1(i) | v_1(j), v_2(i) | v_2(j), \dots, v_L(i) | v_L(j))$,
6 where $|$ is the Boolean OR operator. Finally, define the complementary vector
7 of correlation vector $V(i)$, $V(i)'$ to be the complement of the individual
8 components.

9
10 Let I be the unit correlation vector. All the components of the unit correlation
11 vector are one. The correlation among the N events is defined to be that the
12 occurrence of events i_1, i_2, \dots, i_a prevents the occurrence of events i_{a+1}, \dots, i_L

13 if $\sum_{j=1}^a V(i_j) = I$, (1)

14 where $1 \leq a \leq L, 1 \leq j \leq N, i_j \neq i_k$ and $1 \leq j, k \leq L$. This equation can also be
15 written as

16 $\prod_{j=1}^a V(i_j)' = I'$ (2)

17
18 The correlation vectors determine the correlation among the N events through
19 equation (1) or equation (2). The minimum set optimization is to find a set of
20 events so that the value of the variable a in equation (1) or equation (2)
21 reaches it's minimum.

22
23
24 In a more general case, each event is associated with a time. Let $t(i)$ be the
25 time that event i takes. Then the total time T that events i_1, i_2, \dots, i_a take is

26 $T(i_1, i_2, \dots, i_a) = \sum_{j=1}^a t(i_j)$ (3)

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1 The minimum time optimization problem is to find a set of events so that the
2 total time T reaches it's minimum. This problem is called minimum time
3 optimization. If all the $t(i)$'s are equal, then this problem reduces to the
4 minimum set optimization problem.

5
6 From the formulation of correlated events above, we can see that the values
7 of N and L determine the complexity of the correlation. In practice, the values
8 of N and L are large, so that the optimization problem can be intractable.

12 Minimum Set Optimization Problem

14 If an exhaustive search is performed, the computation across N events
15 requires $O(N!)$ operations, so that this method is not practical for large values
16 of N . The following minimum set optimization algorithm is $O(N^2)$.

18 Define $P_A(B)$ to be the square of the length of the projection of correlation
19 vector B onto correlation vector A . So

$$20 \quad P_A(B) = \sum_{i=1}^L a_i \cdot b_i$$

22 Define $W(i_1, i_2, \dots, i_k)$ to be

$$23 \quad W(i_1, i_2, \dots, i_k) = I \prod_{j=1}^k V(i_j)'.$$

24
25 With this definition, $P_I(W(i_1, i_2, \dots, i_a)) = P_I(I')=0$. By definition, for a given W ,
26 $P_I(W) \geq 0$ and is a decreasing function of k in W . That is, adding a correlation
27 vector to W decreases $P_I(W)$. In the process of searching a minimum set, if

1 we keep the value of $P_l(W)$ to be as small as possible while adding correlation
 2 vectors to W , then the set of events in W will approach a minimum set.
 3 Assume that a set of correlation vectors $V(i_1), V(i_2), \dots, V(i_k)$ in the N vectors is
 4 chosen such that $P_l(W)$ is a minimum. As we add additional vectors to W
 5 from the remaining $N-k$ vectors while we keep $P_l(W)$ to the minimum, we will
 6 eventually reach $P_l(W) = 0$. This set of vectors in W will represent the
 7 minimum set. Referring to **FIG. 1**, and the following pseudo-code, the
 8 minimum time optimization algorithm is summarized:

```

9
10 U(i) = minimum set; W = I; n = 1; // block 110
11 for (l=1; l<=N; l++)
12     {
13         M0 = L and i0 = 1 // block 120
14         for (j=i; j<=N; j++)
15             {
16                 // start block 130
17                 M = Pl(W*V(j)');
18                 if (M <= M0)
19                     {
20                         M0 = M;
21                         i0 = j;
22                     }
23                 // end block 130
24             }
25         // start block 140
26         U(n) = V(i0);
27         if (M0 == 0)
28             stop;
29         // end block 140

```

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1
2      // start block 150
3      W = WU(n)';
4      n=n+1;
5      // end block 150
6      }

```

9 Minimum Time Optimization

11 In this problem, it is necessary to include the changes to $P_I(W)$ and the
 12 changes to time T by $t(i_{k+1})$ when we add the $(k+1)$ th correlation vector into
 13 W . First note that,

$$14 \quad P_A(B) = P_B(A) \quad (4)$$

15 and

$$16 \quad P_A(I) = P_A(B + B') = P_A(B) + P_A(B') \quad (5)$$

17 Using equations (4) and (5), one can readily obtain

$$19 \quad P_{W(i_1, i_2, \dots, i_k)}(V(i_{k+1})) = -[P_I(W(i_1, i_2, \dots, i_{k+1})) - P_I(W(i_1, i_2, \dots, i_k))].$$

20 From this equation, it is seen that $P_{W(i_1, i_2, \dots, i_k)}(V(i_{k+1}))$ is an amount of the
 21 decrement of $P_I(W)$ after adding a $(k+1)$ th correlation vector into W . It is
 22 possible to treat the value of $P_{W(i_1, i_2, \dots, i_k)}(V(i_{k+1}))$ as a measure of a
 23 displacement of $P_I(W)$ towards 0 after time $t(i_{k+1})$ is taken by event (i_{k+1}) .
 24 Then, the quantity $P_{W(i_1, i_2, \dots, i_k)}(V(i_{k+1})) / t(i_{k+1})$ is the measure of the speed
 25 of $P_I(W)$ towards 0 when event vector $V(i_{k+1})$ is added into W . If we choose
 26 the $(k+1)$ th event such that the value of $P_{W(i_1, i_2, \dots, i_k)}(V(i_{k+1})) / t(i_{k+1})$ is a
 27 maximum, then this selection causes the total time T to be a minimum,
 28 $T(i_1, i_2, \dots, i_a)$. Referring to **FIG. 2**, and the following pseudo-code, the minimum
 29 time optimization algorithm is summarized:

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```

1
2  U(i) = the minimum set of correlated events, W = I, and n = 1 // block 210
3  for (i=1;i<=N;i++)
4      {
5          M0 = 0; // block 220
6          for (j=i;j<=N;j++)
7              {
8                  // start block 230
9                  M = Pw(V(j))/t(j);
10                 if (M >= M0)
11                     {
12                         M0 = M;
13                         i0 = j;
14                     }
15                 // end block 230
16             }
17         // start block 240
18         U(n) = V(i0);
19         if (M0 == 0)
20             stop;
21         // end block 240
22         W = WU(n)'; n=n+1; // block 250
23     }
24

```

25 The minimum time algorithm and the minimum set algorithm contain two loops
26 related to the number of events, N. The number of operations is proportional
27 to N² which is much smaller than O(N!). Also, note that bit maps can be used
28 to store the correlation vectors so that less memory is used and bit-wise
29 operations are used to calculate W. The use of bit maps and bit-wise

1 operations also reduce the amount of time required to execute the algorithms.

2

3 When the execution time of each test is the same, the minimum set
4 optimization algorithm can be applied to the determination of how to remove
5 redundant tests and reorder tests in an efficient sequence such that higher
6 efficient tests are executed earlier. When the execution time of each test is
7 different, the minimum time optimization algorithm can be applied to the
8 determination of how to remove redundant tests and the efficient test
9 execution sequence. If we associate N with the number of tests in a given test
10 sequence, and L with the number of DD's, then we can represent the N tests
11 as L-dimensional correlation vectors. With this assignment, it becomes
12 possible to apply the minimum set optimization and minimum time
13 optimization to RIT's.

14

15 While the minimum time optimization and the minimum set optimization have
16 been applied to the RIT's, it will be clear to one of skill in the art that the
17 minimum time optimization and minimum set optimization may be applied to
18 other optimization problems. Examples of other optimization problems
19 include determining DD.

20

21 While the invention has been described in conjunction with specific
22 embodiments, it is evident that many alternatives, modifications, permutations
23 and variations will become apparent to those of ordinary skill in the art in light
24 of the foregoing description. Accordingly, it is intended that the present
25 invention embrace all such alternatives, modifications and variations as fall
26 within the scope of the appended claims.

27

28 What is claimed is:

29

30